

# **CMPSC-265**

# **Data Structures and Algorithms**

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# Review

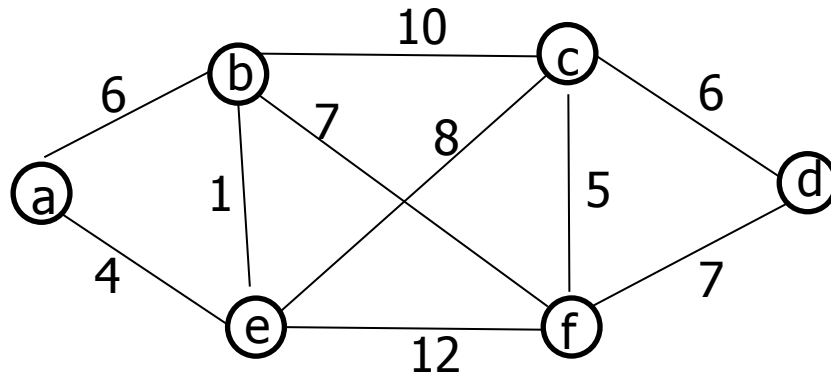
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- Finding Minimum Spanning Tree

# The Shortest Path Problem

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- One of the main problems defined on weighted graphs with many applications (like network routing).
- We want to find the shortest path between nodes.
  - Shortest means lowest cost, shortest distance,...
- Example: Shortest path from a to f is a->e->b->f with cost/distance 12



# Finding shortest paths

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- Single-source shortest paths finding
  - Dijkstra's algorithm
  - Bellman-Ford algorithm
  - Finding single-source shortest paths on a DAG (directed acyclic graph) using Bellman-Ford algorithm and topological sorting
- All-pairs shortest paths finding
  - Floyd-Warshall algorithm

# The Single Source Shortest Path Problem

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- Starting from a node, find shortest paths to all other nodes.
  - Finding shortest path between two specific nodes is as complex as finding shortest paths from a source node to all other nodes.
- Dijkstra's algorithm is a *greedy* algorithm to solve the single source shortest path problem.
  - It is similar to the Prim's algorithm.
  - At every step, adds an unvisited node (not in the shortest path tree yet) which has the shortest distance from the source.
  - It then updates the distance from source to neighbors of the newly added node.

# Dijkstra's Algorithm

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$S$  = source node,  $T$  = visited set,  $D(v)$  = (shortest) distance to  $v$ ,  $w(i,j)$  = weight of edge  $ij$

//Initialization

$T = \{S\}$

For every vertex  $v$ :

if  $v$  is adjacent to  $S$ , then  $D(v) = w(S,v)$

Else  $D(v) = \infty$

While there are vertices left (not in  $T$ ):

Find a node  $u$  such that  $u$  is not in  $T$  and  $D(u)$  is minimum

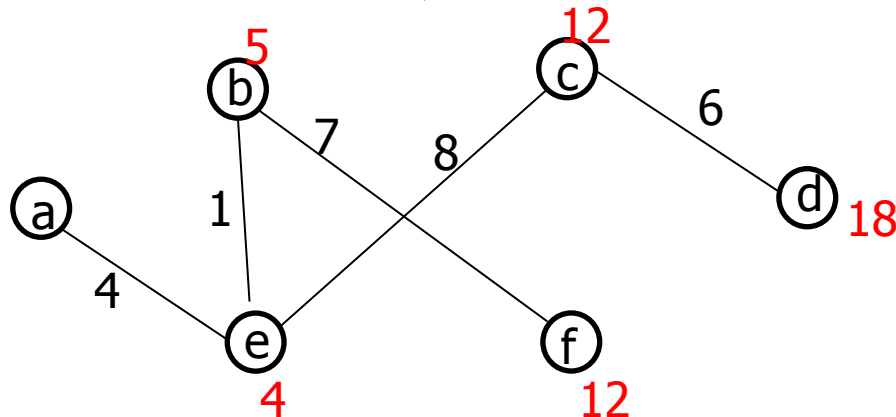
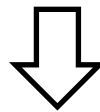
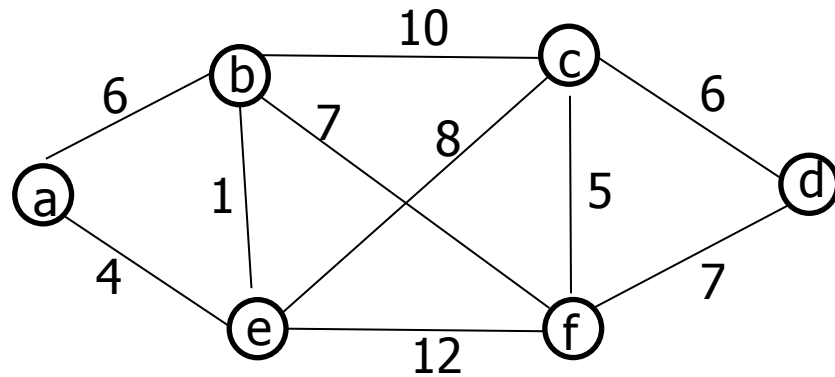
Add  $u$  to  $T$

for every neighbor  $v$  of  $u$  which is not in  $T$ :

update  $D(v)$  as  $D(v) = \min[D(v), D(u) + w(u,v)]$

# Dijkstra's Algorithm-Example

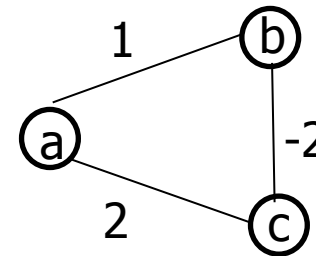
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# Comments on Dijkstra's Algorithm

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- It is based on the intuition that adding edges will not make distance shorter. Is it optimal?
- Would it work if edges have negative weights?
  - No, consider this example:



- Dijkstra find shortest path from a to b as a->b with cost of 1, but if we take a->c->b we get there with cost of 0.
- What is wrong? Why does this happen?
  - That's because we do greedy, we finalize a node without considering other possible paths.



# Comments on Single Source Shortest Paths

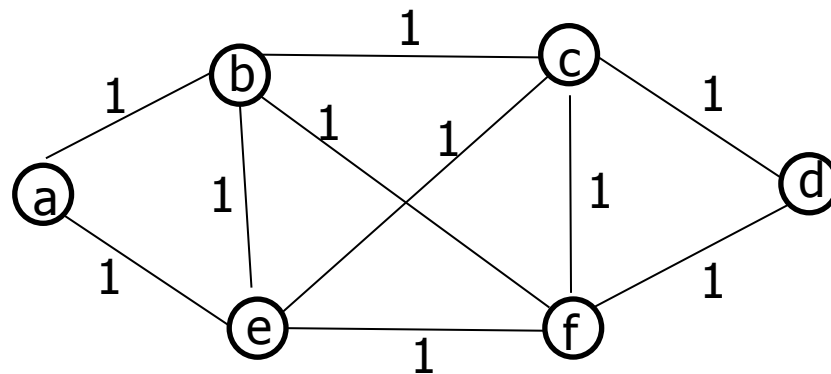
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- If you add a constant positive to edge weights to get rid of negative weights, would it solve the problem in Dijkstra's algorithm?
  - It changes the graph and it results in different paths that are not shortest ones in the original graph.
- Dijkstra's algorithm works on directed or undirected graphs with no negative edge weights.
- Time complexity of Dijkstra's algorithm?
  - It is the same as Prim's algorithm.

# Special Case of Single Source Shortest Paths

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- A special case when all edge weights are identical.
- Just do BFS, and keep track of the previous node.
- This is faster than Dijkstra's algorithm.
- How about DFS?



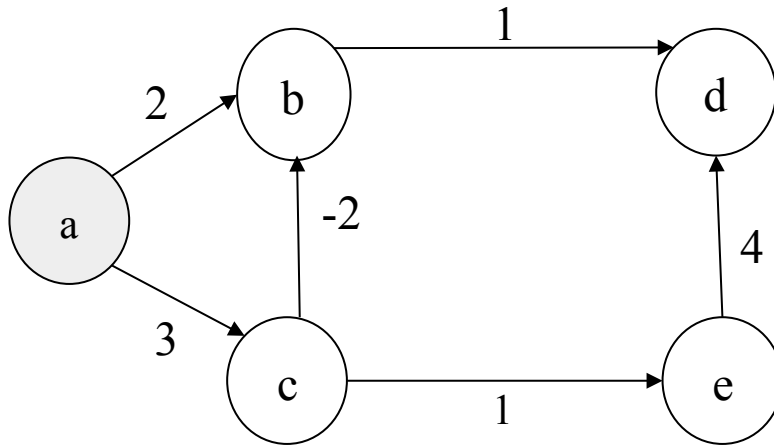
# Bellman-Ford Shortest Path Algorithm

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- Bellman-Ford algorithm works with negative-weight edges:
  - Based on *Dynamic Programming* instead of Greedy
    - In dynamic programming you save results of sub-problems in a table to be re-used (instead of re-computing them). Example, store results of Fibonacci numbers in an array instead of making recursive calls.
  - Use a table (one-dimensional array of size N) to save distance to each node, initialize with infinity except for the source which is 0 distance from itself.
  - N-1 times:
    - look at all edges and see if you need to update distance from source (update table). For edge  $u \rightarrow v$  do:  $D(v) = \min[D(v), D(u) + w(u,v)]$
  - At iteration  $i$ , it finds shortest paths with at most  $i$  edges. So, it is enough to iterate N-1 times, since a shortest path cannot have more than N-1 edges.

# Bellman-Ford Shortest Path Algorithm - Example

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d[]	a	b	c	d	e

parent[]	a	b	c	d	e

# Comments on Bellman-Ford Algorithm

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- Works with negative-weight edges.
- $O(E \cdot N)$ , Not as fast as Dijkstra's algorithm.
- What if you have negative-weight cycles?
  - Bellman-Ford detects them. How?
    - Do one more iteration(after that  $N-1$  iterations), if you see an improvement in updating distances, it means there is a negative-weight cycle.
  - Ok, but what can you do then?
    - Nothing, maybe just report that you found it.

# Bellman-Ford Shortest Path Algorithm

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## Pseudo-code for Bellman-Ford:

Initialize the tables/vectors  $d$  and  $parent$

for  $i := 1$  to  $N - 1$  do

    for each edge  $(u, v) \in E$  do

        if  $d[v] > d[u] + w(u, v)$

            then  $d[v] := d[u] + w(u, v)$

$parent[v] := u$

for each edge  $(u, v) \in E$  do

    if  $d[v] > d[u] + w(u, v)$

        then return false // there is a negative cycle

return true

# Single-Source Shortest Path in a DAG

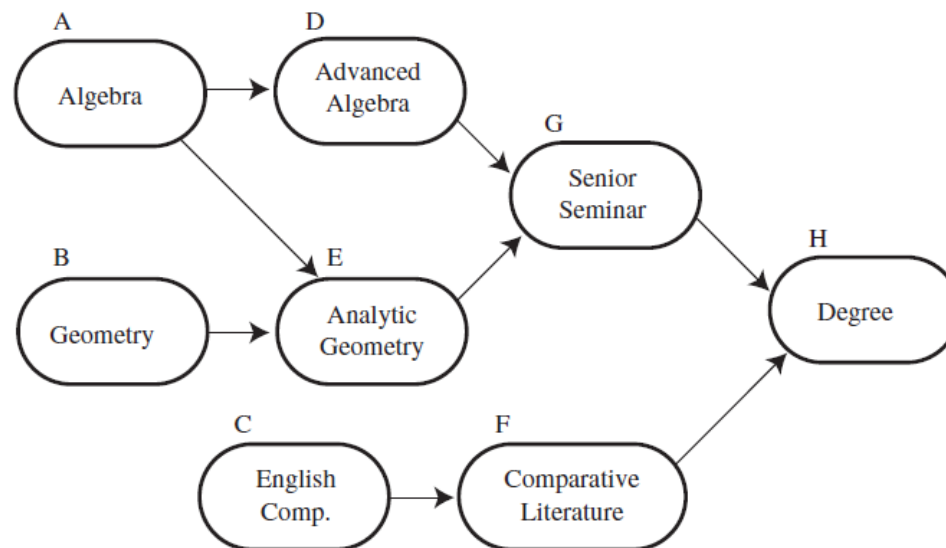
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- Given a Directed Acyclic Graph (DAG), how do you find the shortest paths efficiently? Can we do better than bellman-ford?
  - Yes, when there is no cycle, we can be done in one pass if we have a *proper ordering* to go over edges.
  - We can make use of **topological sort/ordering**
- The idea is to go over the edges based on topological ordering and do the same update of distance values as in bellman-ford.
- Time complexity?

# Topological Sorting in Directed Graphs

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- Nodes must be traversed in a specific order.
- Example: course prerequisites
  - ABCDEFGH is one possible way to get a degree, satisfying prerequisites.





# Topological Sorting in Directed Graphs

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- Three steps:
  - Find a vertex that has no successors (the successors to a vertex are those vertices that are directly downstream from it connected by a directed edge).
  - Delete this vertex from the graph, and insert its label at the beginning of the list (insertFirst() in LinkedList).
  - Repeat steps 1 and 2 until all vertices are gone. At this point, the list shows the vertices arranged in topological order.
- What if there is a cycle?
  - It does not work. It works on Directed Acyclic Graphs (DAG).

# Topological Sorting in Directed Graphs

```
public void topo() // topological sort
{
    int orig_nVerts = nVerts; // remember how many verts
    while(nVerts > 0) // while vertices remain,
    {
        // get a vertex with no successors, or -1
        int currentVertex = noSuccessors();
        if(currentVertex == -1) // must be a cycle
        {
            System.out.println("ERROR: Graph has cycles");
            return;
        }
        // insert vertex label in topo-sorted array (start at end)
        sortedArray[nVerts-1] = vertexList[currentVertex].label;
        deleteVertex(currentVertex); // delete vertex
    } // end while

    // vertices all gone; display sortedArray
    System.out.print("Topologically sorted order: ");
    for(int j=0; j<orig_nVerts; j++)
        System.out.print( sortedArray[j] );
    System.out.println("");
} // end topo
```

How to find a vertex with no successors?

- Adjacency Matrix: A row with all zeros
- Adjacency List: array cell with an empty list (null entry)

How to delete a vertex?

# Topological Sorting using DFS

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- We can use a similar idea as DFS to do topological sorting:
  - Start from any node, mark it as visited
  - Instead of printing the current node first(as in DFS), recursively call topological sorting on all its unvisited neighbors.
  - When the current node is fully explored (no more unvisited neighbors left), push it to a stack.
  - Continue until no more unvisited nodes left.
- At the end, stack contains the topological sort.

# Shortest Paths Algorithm in a DAG

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Pseudo-code for DAG shortest paths:

Initialize the tables/vectors  $d$  and  $parent$

do topological sorting

for each node  $u$  taken from the topologically sorted order do

    for each edge  $(u, v)$  do

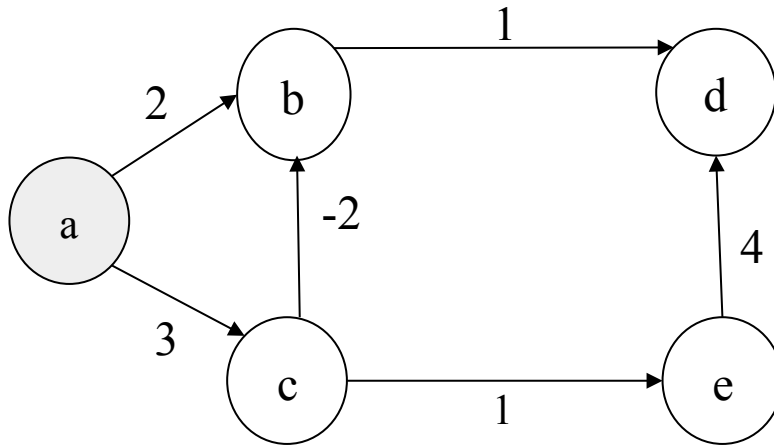
        if  $d[v] > d[u] + w(u, v)$

            then  $d[v] := d[u] + w(u, v)$

$parent[v] := u$

Time complexity  $O(N+E)$

# Shortest Paths Algorithm in a DAG - Example



Topological sort: a, c, b, e, d

d[]	a	b	c	d	e

parent[]	a	b	c	d	e

# All Shortest Path Algorithms

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- Find all shortest paths from all nodes to all other nodes.
  - Floyd-Warshall Algorithm
    - It is based on *Dynamic Programming*
- Floyd-Warshall has  $O(N^3)$  time complexity, which is better than calling single source shortest path algorithm  $N$  times.

```
for (int k = 1; k <= N; k++)  
    for (int i = 1; i <= N; i++)  
        for (int j = 1; j <= N; j++)  
            if ( ( d[i][k] + d[k][j] ) < d[i][j] )  
                d[i][j] = d[i][k] + d[k][j];
```